

#### SISG Module 3/SISMID Module 4

Introduction to R

Ken Rice Tim Thornton

University of Washington

Seattle, July 2017

#### Introduction: Course Aims

This is a *first* course in R. We aim to cover;

- Reading in, summarizing & managing data
- Use of functions in R doing jobs by programming, not by using drop-down menus (much)
- Some standard functions for statistical analysis but minimal statistics in this module
- How to use other people's code, how to get help, what to learn next

We assume no previous use of R, also non-extensive programming skills in other languages. If this is *not* your level, please consider switching to a later module. Most importantly, the class site is

http://faculty.washington.edu/kenrice/rintro

Contains (or will contain);

- PDF copies of slides (in color, and contains a few hyperlinks)
- All datasets needed for exercises
- Exercises for you to try
- Our solutions to exercises (later!)
- Links to other software, other courses, book, and places to get R help
- Links to a few helpful websites/email list archives

Of course, search engines will find much more than this, and can be a useful start, when tackling analyses with R.

#### Introduction: About Tim



- Associate Prof, UW Biostat
- A useR and an instructoR
- Research in Genetic
   Epidemiology for Complex
   Human Traits

#### Introduction: About Ken



- Associate Prof, UW Biostat
- AuthoR of a few R packages, useR, teacheR
- Genetic/Genomic research in Cardiovascular Epidemiology

... and you?

(Briefly, who are you, what's your genetics/infectious disease?)

#### Introduction: Course structure

10 sessions over 2.5 days

- Day 1; (Mostly RStudio) Data management, using functions
- Day 2; (Standard R) More about programming
- Day 2.5; More advanced ideas

Web page: http://faculty.washington.edu/kenrice/rintro/

#### **Introduction: Session structure**

What to expect in a typical session;

- 45 mins teaching (please interrupt!)
- 30 mins hands-on; please work in pairs
- 15 mins summary, discussion/extensions (interrupt again!)

There will also be one 'take-home' exercise, on Day 2; the final session will include in-depth discussion/evaluation.

Please note: the 2.5 day course moves quickly, and later material builds on earlier material. So, **please interrupt!** 



# 1. Reading in data

#### Ken Rice Tim Thornton

University of Washington

Seattle, July 2017

### What is R?

R is a 'programming environment for statistics and graphics'

- Does *basically* everything, can also be extended
- It's the default when statisticians implement new methods
- Free, open-source

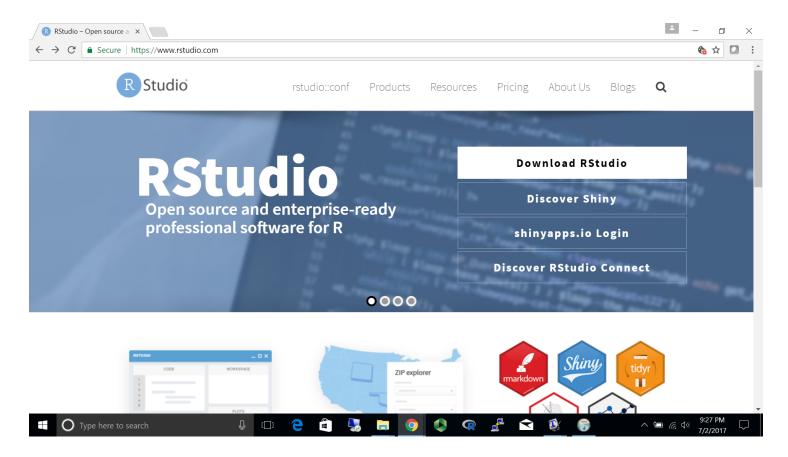
But;

- Steeper learning curve than e.g. Excel, Stata
- Command-line driven (programming, not drop-down menus)
- Gives only what you ask for!

To help with these difficulties, we will begin with RStudio, a graphical user interface (front-end) for R that is slightly more user-friendly than 'Classic' R's GUI.

So *after* installing the latest version of R...

In your favorite web browser, download from rstudio.com;



- Select& download the FREE installer for your system
- Default installation is fine
- Working in pairs *highly* recommended

You should also install R - RStudio is a 'front end' to R itself. On first startup, RStudio should look like this; (up to version and Mac/PC differences)

#### RStudio $\square$ X File Edit Code View Plots Session Build Debug Profile Tools Help 💽 🔹 🥣 🖌 📄 📄 🍐 🖍 Go to file/function 📄 📰 🔹 Addins 🔹 Project: (None) • P Environment History $\neg \Box$ Console ~/ 🕣 🔚 🖃 Import Dataset 👻 🚽 🗏 List 💌 🖾 R version 3.4.1 (2017-06-30) -- "Single Candle" Q 🛑 Global Environment 💌 Copyright (C) 2017 The R Foundation for Statistical Computing Platform: x86\_64-w64-mingw32/x64 (64-bit) R is free software and comes with ABSOLUTELY NO WARRANTY. Environment is empty You are welcome to redistribute it under certain conditions. Type 'license()' or 'licence()' for distribution details. R is a collaborative project with many contributors. Type 'contributors()' for more information and 'citation()' on how to cite R or R packages in publications. Files Plots Packages Help Viewer $-\Box$ 🐑 New Folder 🛛 👰 Delete 🛛 🛶 Rename 🖤 More 🔻 Type 'demo()' for some demos, 'help()' for on-line help, or 🗋 🏠 Home .... 'help.start()' for an HTML browser interface to help. Type 'q()' to quit R. A Name Modified Size I.Rhistory 16.1 KB Jul 2, 2017, 9:34 >

If you've used it before, RStudio defaults to remembering what you were doing.

We'll use the 'Console' window first – as a (fancy!) calculator

```
> 2+2
[1] 4
> 2^5+7
[1] 39
> 2^(5+7)
[1] 4096
> exp(pi)-pi
[1] 19.9991
> log(20+pi)
[1] 3.141632
> 0.05/1E6  # a comment; note 1E6 = 1,000,000
[1] 5e-08
```

- All common math functions are available; parentheses (round brackets) work as per high school math
- Try to get used to bracket matching. A '+' prompt means the line isn't finished hit Escape to get out, then try again.

R stores data (and everything else) as *objects*. New objects are created when we *assign* them values;

```
> x <- 3
> y <- 2 # now check the Environment window
> x+y
[1] 5
```

Assigning new values to existing objects over-writes the old version – and be aware there is no Ctrl-Z 'undo';

```
> y <- 17.4 # check the Environment window again
> x+y
[1] 20.4
```

- Anything after a hash (#) is ignored e.g. comments
- Spaces don't matter
- Capital letters *do* matter

#### **RStudio: Reading in data**

To import a dataset, follow pop-ups from the Environment tab;

Environment History					
🞯 🔒 📑 Import Dat	taset 👻 🍕	≡ List •   🚱			
Global From CS	v_ Q				
From Exc	cel				
From SP	onment is empty				
From SA					
From Sta	ata				
Import Text Data					
File/Url:					
			Browse		
Data Preview:	Choose File			×	
	$\leftarrow \rightarrow \cdot \uparrow \downarrow \rightarrow$ This	PC > Desktop > rintro >	・ ひ Search rintro	<u>م</u>	
Import Options:	Organize • New folder		III - 🔳	0	_
Name: dataset	🖿 Desktop 🛛 🖈 🔨	Name	Date modified	Import Text Data	
Skip: 0	🔈 Downloads 🖈	exercises	7/2/2017 9:10 PM	File/Url:	
	📔 Documents 🚿	ShinyExample	1/5/2017 7:43 AM	C:/Users/kenrice/Desktop/rintro/mammals.csv Browse	
	📄 Pictures 🛛 🖈	slides	7/2/2017 9:15 PM	Data Preview:	
Code Preview:	fullprof	a mammals	7/2/2017 9:51 PM	species body brain	
library(readr)	)			(character) <sup>™</sup> (double) <sup>™</sup> (double) <sup>™</sup>	_
View(dataset)				Previewing first 50 entries.	_
	reviewing			Import Options:	_
	CneDrive			· Name: mammals V First Row as Names Delimiter: Comma   Escape: None	
				Skip: 0 Trim Spaces Quotes: Default * Comment Default *	
	interview Street			Open Data Viewer Locale: Configure NA: Default	
	🥩 Network 🗸 🗸	c			A
				Code Preview:	4
	File name	e: mammals		mammals <- read_csv("C:/Users/kenrice/Desktop/rintro/mammals.csv")	
			Open Cancel	View(mammals)	
				[Import] Cancel	

More on those options;

- Name: Name of the object that will store the whole dataset, when it's read in
- First row as names: names make variables easier to understand
- **Delimiter**: what's between items on a single line?
- **NA**: How are missing values denoted?

The defaults are sensible, but R assumes you *know* what your data *should* look like – and whether it has named columns, numeric/character data, etc. *No* software is smart enough to cope with every format that might be used by you/your colleagues to store data.

#### **RStudio: Reading in data**

After successfully reading in the data;

- The environment now includes a mammals object or whatever you called the data read from file
- A copy of the data can be examined in the Excel-like data viewer (below) if it looks weird, find out why & fix it!

🔞 RStu	dio							_	. 🗆	$\times$
	t Code View Plots S 🍞 ᠇ 🔒 📾 🏳		3	ofile Tools Help					🔳 Proje	ct: (None) 🔹
mar	nmals 🛪			_		Environment	History			-0
00	I Filter			Q		🞯 🔒  🖻	Import Dataset 🔹	1	≡ Li	st • 🕝
	species ÷	body 🌐	brain 🍦			diobal Envi	ironment 🝷		2,	
1	Arctic fox	3.385	44.50		~	Data				
2	Owl monkey	0.480	15.50			💽 mammals	62 obs.	of 3 variables		
3	Mountain beaver	1.350	8.10							
4	Cow	465.000	423.00							
5	Grey wolf	36.330	119.50							
6	Goat	27.660	115.00							
7	Roe deer	14.830	98.20							
	Guinea nig	1 040	5 50		$\sim$					
	1 to 8 of 62 entries									
_			=							
Consol	e ~/ 🛱			_						
	rary(readr)	- 6.			^					
> mam ls.cs		C:/Users	/kenrice/De	sktop/rintro/mamma						
	d with column spec	ificatio	on:							
cols(										
	cies = col_charact y = col_double(),	er(),								
	in = col_double()									
)										
	w(mammals)						/	×		
>					$\sim$	Files Plots	Packages Help	Viewer		60

... we'll return later, to read\_csv() in the Console window

What's a good name for my new object?

- Something memorable (!) and not easily-confused with other objects, e.g. X isn't a good choice if you already have x
- Names must start with a letter or period ("."), after that any letter, number or period is okay
- Avoid other characters; they get interpreted as math ("-","\*") or are hard to read ("\_") so should not be used in names
- Avoid names of existing functions e.g. summary. Some oneletter choices (c, C, F, t, T and S) are already used by R as names of functions, it's best to avoid these too

#### **Operating on data**

To operate on data, type commands in the Console window, just like our earlier calculator-style approach;

> str(mammals) # edited output										
Classes tbl_df, tbl and 'data.frame': 62 obs. of 3 variables:										
<pre>\$ species: chr "Arctic fox" "Owl monkey" "Mountain beaver" "Cow"</pre>										
<pre>\$ body : num 3</pre>	.38 0.48 1.35 465 3	6.33								
\$ brain : num 44	1.5 15.5 8.1 423 11	9.5								
> summary(mammals)										
species	body	brain								
Length:62	Min. : 0.005	Min. : 0.14								
Class :character	1st Qu.: 0.600	1st Qu.: 4.25								
Mode :character	Median : 3.342	Median : 17.25								
	Mean : 198.790	Mean : 283.13								
	3rd Qu.: 48.203	3rd Qu.: 166.00								
	Max. :6654.000	Max. :5712.00								

- str() tells us the structure of an object
- summary() summarizes the object

Can also use these commands on any object - e.g. the single numbers we created earlier (try it!)

#### **Operating on data: columns**

Individual columns in data frames are identified using the symbol – just seen in the str() output.

#### > mammals\$brain

[1]	44.50	15.50	8.10	423.00	119.50	115.00	98.20	5.50	58.00	
[10]	6.40	4.00	5.70	6.60	0.14	1.00	10.80	12.30	6.30	
[19]	4603.00	0.30	419.00	655.00	3.50	115.00	25.60	5.00	17.50	
[28]	680.00	406.00	325.00	12.30	1320.00	5712.00	3.90	179.00	56.00	
[37]	17.00	1.00	0.40	0.25	12.50	490.00	12.10	175.00	157.00	
[46]	440.00	179.50	2.40	81.00	21.00	39.20	1.90	1.20	3.00	
[55]	0.33	180.00	25.00	169.00	2.60	11.40	2.50	50.40		
> summary(mammals\$brain)										
Min. 1st Qu. Median Mean 3rd Qu. Max.										
0	0.14 4.25 17.25 283.10 166.00 5712.00									

Think of \$ as 'apostrophe-S', i.e. mammals'S brain.

Unlike many other statistical packages, R can handle *multiple* datasets at the same time – helpful if your data are e.g. phenotypes & genotypes, or county & disease outbreak data. This isn't possible without \$, or *some* equivalent syntax.

#### **Operating on data: columns**

New columns are created when you assign their values – here containing the brain weights in kilograms;

```
> mammals$brainkg <- mammals$brain/1000
> str(mammals)
Classes tbl_df, tbl and 'data.frame': 62 obs. of 4 variables:
   $ species: chr "Arctic fox" "Owl monkey" "Mountain beaver" "Cow" ...
   $ body : num 3.38 0.48 1.35 465 36.33 ...
   $ brain : num 44.5 15.5 8.1 423 119.5 ...
   $ brainkg: num 0.0445 0.0155 0.0081 0.423 0.1195 ...
> summary(mammals$brainkg)
   Min. 1st Qu. Median Mean 3rd Qu. Max.
0.00014 0.00425 0.01725 0.28313 0.16600 5.71200
```

- Assigning values to existing columns over-writes existing values – again, with no warning
- With e.g. mammals\$newcolumn <- 0, the new column has every entry zero; R *recycles* this single value, for every entry
- It's unusual to delete columns... but if you *must*; mammals\$brainkg <- NULL</li>

#### **Operating on data: columns**

Some other functions useful for summarizing data frames, and their columns;

```
> names(mammals)
[1] "species" "body" "brain"
> dim(mammals)  # dim is short for dimension
[1] 62 3
> length(mammals$body) # how many rows in our dataset?
[1] 62
> min(mammals$body)
[1] 0.005
> max(mammals$body)
[1] 6654
> range(mammals$body)
[1] 0.005 6654.000
> mean(mammals$brain)
[1] 283.1342
> sd(mammals$brain) # sd is short for standard deviation
[1] 930.2789
> median(mammals$brain)
[1] 17.25
```

#### **RStudio: the Script window**

While fine for occasional use, entering *every* command 'by hand' is error-prone, and quickly gets tedious. A *much* better approach is to use a Script window – open one with Ctrl-Shift-N, or the drop-down menus;

RStudio				RStudio					
File Edit Code View P	lots Session Pr	oject Build	l Tools Help		File Edit Code View Plots Session Project Build Tools Help				
थू-  🛫 - 🔒 🔒 🚔	Go to file/fu	nction		💽 🗸 🥣 🖌 🔝 🚔 🗁 Go to file/function					
R Script Ctrl+Shift+N			_		mammals × 🕑 Untitled1* ×				
Text Create a new R		62 ob	servations of 2 varia	bles	🔷 💠 🔚 🔲 Source on Save 🛛 💁 🌽 🗸 📑 🔂 🔂 Source 🗸 👔				
C C/C++ rite	body	brain			1 hames(mammals)	*			
R Sweave	3.385	44.50		=	2 dim(mammals) 3 length(mammals\$body)				
-	0.480	15.50			4 min(mammals\$body)				
R Markdown	1.350	8.10			5 max(mammals\$body)				
🕙 R HTML	465.000	423.00			6 range(mammals\$body)				
R Documentation	36.330	119.50							
6 Goat	27.660	115.00							
7 Roe deer	14.830	98.20							
8 Guinea pig	1.040	5.50				$\overline{\mathbf{v}}$			
9 Verbet	4.190	58.00		-	1:1 (Top Level)  R Scrip	t ÷			

- Opens a nice editor, enables saving code (.R extension)
- Run current line (or selected lines) with Ctrl-Enter, or Ctrl-R

#### **RStudio: the Script window**

**An important notice:** from now on, we assume you are using a script editor.

- First-time users tend to be reluctant to switch! but it's worth it, ask any experienced user
- Some code in slides may be formatted for cut-and-paste into scripts – it may not look exactly like what appears in the Console window
- Exercise 'solutions' given as .R files
- Scripts make it easy to run slightly modified code, without re-typing everything remember to save them as you work
- Also remember the Escape key, if e.g. your bracket-matching goes wrong

For a very few jobs, e.g. changing directories, we'll still use drop-down menus. But commands *are* available, for all tasks.

To identify general subsets - not just the columns selected by \$
- R uses square brackets. Selecting individuals elements;
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320
> mammals\$brain[32] # 32nd element of mammals\$brain
[1] 1320

Can also select entire columns or entire rows this way – and 'blank' entries indicate you want everything.

```
> mammals[32,2] # subtable with just 32nd row, 2nd column
# A tibble: 1 x 1
body
1 62
> mammals[32,] # everything in the 32nd row
# A tibble: 1 x 3
species body brain
1 Human 62 1320
> sum(mammals[,3]) # sum of all the brains masses...
[1] 17554.32
```

Suppose we were interested in the brain weight (i.e. 2nd column) for mammals (i.e. rows) 14, 55, & 61. How to select these multiple elements?

```
> mammals[c(14,55,61),2]
  body
1 0.005 # check these against data view
2 0.048
3 0.104
But what is c(14,55,61)? It's a vector of numbers – c() is for
combine;
> length(c(14,55,61))
[1] 3
> str(c(14,55,61))
num [1:3] 14 55 61
We can select these rows and all the columns;
> mammals[c(14,55,61),]
                   species body brain
1 Lesser short-tailed shrew 0.005 0.14
2
                Musk shrew 0.048 0.33
3
                Tree shrew 0.104 2.50
```

A very useful special form of vector;

```
> 1:10
[1] 1 2 3 4 5 6 7 8 9 10
> 6:2
[1] 6 5 4 3 2
> -1:-3
[1] -1 -2 -3
```

R expects you to know this shorthand – see e.g. its use of 1:3 in the output from str(), on the previous slide. For a 'rectangular' selection of rows and columns;

>	mamn	nals[20	):22,	1:3]	
		spec	cies	body	brain
1	Big	brown	bat	0.023	0.3
2		Dor	ıkey	187.100	419.0
3		Ho	orse	521.000	655.0

Negative values correspond to *dropping* those rows/columns;

```
> mammals[-3:-62, c(1,3)] # everything but the first two rows, & columns c(1,3)
      species brain
1 Arctic fox 44.5
```

```
2 Owl monkey 15.5
```

As well as storing numbers and character strings (like "Donkey", "Big brown bat") R can also store *logicals* – TRUE and FALSE.

To make a new vector, with elements that are TRUE if body mass is above 500kg and FALSE otherwise;

```
> is.heavy <- mammals$body > 500
> table(is.heavy) # another useful data summary command
is.heavy
FALSE TRUE
  58
         4
Which mammals were these? (And what were their masses?)
> mammals[is.heavy,]
                            # just the rows for which is.heavy is TRUE
          species body brain
   Asian elephant 2547 4603
1
2
            Horse
                   521
                       655
3
          Giraffe 529 680
4 African elephant 6654 5712
```

Use e.g. mammals[is.heavy,3] to combine TRUE/FALSE (rows) and numbers (columns)

One final method... for now! Instead of specifying columns of interest by number, or through vectors of TRUEs/FALSEs, we can also just give the names – as *character strings*, or vectors of character strings.

```
> mammals[1:3,"body"]
    body
1 3.385
2 0.480
3 1.350
> mammals[is.heavy,c("species","body")]
        species body
1 Asian elephant 2547
2 Horse 521
3 Giraffe 529
4 African elephant 6654
```

- this is more typing than the other methods, but is *much* easier to debug/reuse. Neither is 'right' or 'wrong' - R is just flexible.

When you're finished with RStudio;

- Ctrl-Q, or the drop-down menus, or entering q() at the command line all start the exit process
- You will be asked "Save workspace image to  $\sim$ /.RData?"
  - No/Don't Save: nothing is saved, and is not available when you re-start. This is recommended, because you will do different things in each session
  - Yes: Everything in memory is stored in R's internal format (.Rdata) and will be available when you re-start RStudio
  - Cancel: don't quit, go back
- Writing about what you did (output from a script) often takes much longer than re-running that script's analyses – so often, a 'commented' script is all the R you need to store

To get rid of *objects* in your current session, use rm(), e.g. rm(is.heavy, mammals, x, y) ... or RStudio's 'broom' button.

#### Summary

- In RStudio, read in data from the pop-up menu in the Environment window (or Tools menu)
- Data frames store data; can have many of these objects and multiple other objects, too\*
- Identify vectors with \$, subsets with square brackets
- Many useful summary functions are available, with sensible names
- Scripts are an important drudgery-avoidance tool!

\* ... RStudio's new-ish 'tibble' format is actually a very close relative of a standard R data frame. Not all sources take this into account.